

## Context

The remote sensing data offers a uniform measurement over a large area.

Remote sensing provides direct measurement of various geophysical properties, such as reflectance, emission and absorption of electro magnetic energy.

These geophysical properties are *partially* controlled by things of interest to epidemiologists, such as vegetation.

The actual remote sensing data can be used directly or ....

- It can be classified.
- It can be integrated into models.
- · It can be converted into products.



## **Dimensionality**

The sensor measures multiple wavelengths at each pixel.

All energy within a pixel for a wavelength band pass is integrated to a single integer in the range 0 - 255 ( $2^8$ ).

Each band is independent. The Thematic Mapper (TM) has 7 bands. For the TM a pixel is measured in 7 dimensions with a precision of 28 bits. In theory each pixel could have any one of (28)\*\*7 values.

### This is a very, very big number.

In practice the bands are correlated and all the available dynamic range is not used. Practically, each pixel has only one of  $\sim (2^7)^{**4}$  possible values.



This is merely a very big number.

# The Concept of Classification

Classification is a way to reduce the dimensionality and precision to something a human can understand.



Classification changes SCALAR data into NOMINAL data!

The names used come from a FEATURE SPACE. The names and the feature space are abstractions!

Conversion from scalar to nominal loses information and introduces error

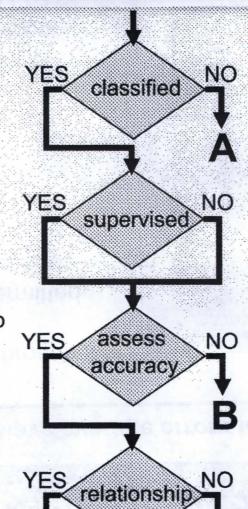


# **Process Logic**

Start with the scalar geophysical measurement

Classification creates a statistical connection between scalar data and a feature space

How strong is the relationship between the nominal designation (the class) and some "objective" standard?



Classification is NOT required

The 
"I hope I am right" 
option



# Sources of Classification Error

Most classifications have average errors in the range of 25 - 40%.

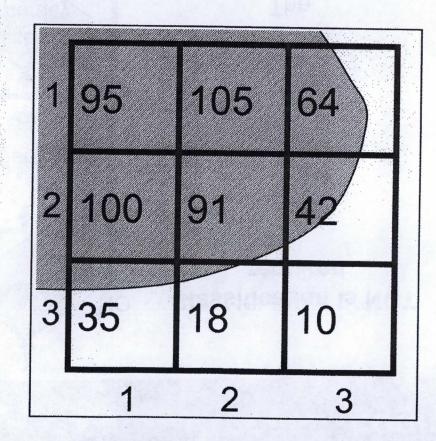
### Example:

"Forcing a square peg through a round hole."

Only two classes are permitted, plain (low number) or hashed (high number). So pixel (2,3) is what?

### Example:

"Variables don't and constants aren't." The measurements always have "noise". Note the values in pixels (1,1), (1,2) and (2,1).





Doug Rickman MSFC/NASA HELIX-Israel April 2008 Note: there is a white rectangle used to clip the diagonal shading.

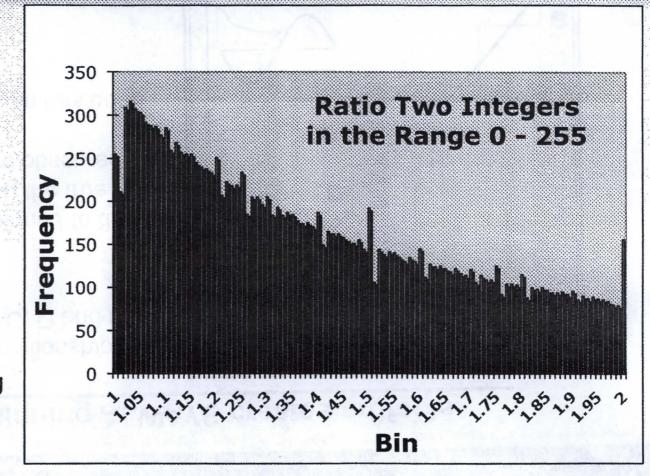


### Example:

The raw satellite data are INTEGER.

Most logical algorithms assume REAL domain input.

This can cause some fascinating and entertaining problems.





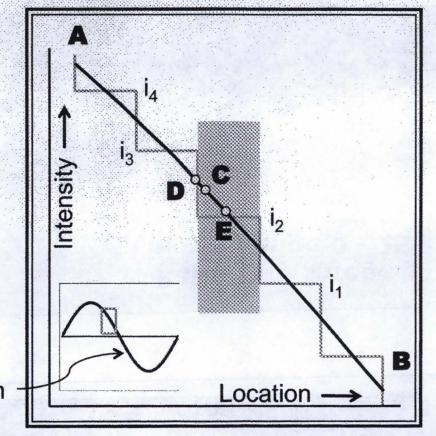
# Mathematical Logic Errors

### **Binning ALWAYS creates artifacts**

What are the relationships between points C, D and E?

If the data are binned to the values i<sub>2</sub> and i<sub>3</sub> the true relationship are obscured AND spurious information has been added.

**Actual function** 





## **Conclusion & Recommendation**

In a review of publications applying remote sensing to epidemiology

- · most were found to use classification
- · none gave any information about the accuracy of the classification.

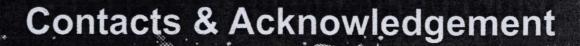
Therefore, their results

- · can only reveal how their health data related to their subset,
- they don't really know what that subset is,
- nor do they know if the subset can be reproduced!

It is strongly recommended that epidemiological studies utilize the full information content of the remote sensing material.

- This means using the full dimensionality or some statistically defensible expression of the total or a derived product.
- The computational burden, which 25 years ago was huge, is now easily handled by ordinary desktop systems.





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#### **Illustrative Website**

http://www.ghcc.msfc.nasa.gov/ follow Applications: Health and Environment link to http://weather.msfc.nasa.gov/helix/helix\_home1.html

### **Current Significant Public Health Partners**

Leslie McClure, University of Alabama, Birmingham Judith Qualters, Centers for Disease Control and Prevention Amanda Niskar, Tel Aviv University Bill Sprigg, University of Arizona



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